

# Optimal cross-correlation estimators

Theory / Joint Probes session

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## Angular galaxy correlations

- The observed galaxy angular number density is a sum of the intrinsic clustering of galaxies, distortions due to lensing magnification, and shot noise,

$$\delta(\mathbf{x}) = \delta_g(\mathbf{x}) + \delta_\mu(\mathbf{x}) + \epsilon \quad (1)$$

- The galaxy angular (cross-)correlation functions in tomographic bins have in principle the following contributions:

$$w(\theta) = w_{gg}(\theta) + w_{g\mu}(\theta) + w_{\mu g}(\theta) + w_{\text{SN}} \quad (2)$$

- With photo- $z$  errors, it can be difficult to separate these contributions due to 'soft' tomographic bin boundaries.

## Optimal redshift weighting (1)

Each term contributing to the cross-correlation can be written as a projection of the 3D matter or galaxy correlation function, assuming Limber's approximation, flat-sky approximation, and zero spatial curvature,

$$w_{XY}(\theta) = \int_0^{\chi_\infty} d\chi W_X(\chi) W_Y(\chi) \xi(\chi\theta), \quad (3)$$

where  $W_X(\chi)$  is either a redshift distribution or lensing kernel for a given sample, and,

$$\xi(r) \equiv \int \frac{k dk}{2\pi} P(k) J_0(kr), \quad (4)$$

where  $P(k)$  is the 3D matter or galaxy power spectrum and  $J_0$  is the zeroth order Bessel function and we have neglected redshift space distortions.

## Optimal redshift weighting (2)

The Limber equation is a *Fredholm integral equation of the 1st kind*,

$$w_{XY}(\theta) = \int_0^{\chi_\infty} d\chi W_X(\chi) K(\chi, \theta), \quad (5)$$

where  $K(\chi, \theta) \equiv W_Y(\chi) \xi(\chi\theta)$ .

**Use eigenvectors of  $K$  to describe the optimal solution space.**

But,  $K(\chi, \theta)$  is not Hermitian ( $K(\chi, \theta) \neq K(\theta, \chi)$ ).

A better kernel is found by considering the square of  $K(\chi, \theta)$ ,

$$C(\chi, \chi') \equiv \int d\theta K(\chi, \theta) K(\chi', \theta), \quad (6)$$

so that,

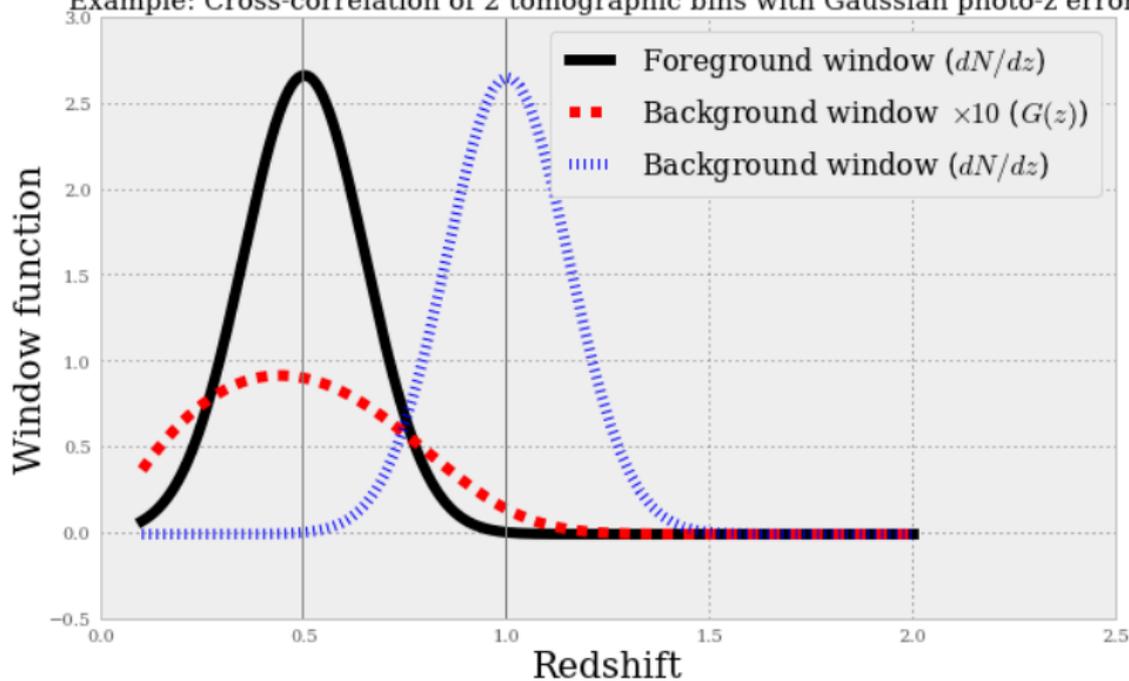
$$\int d\chi C(\chi, \chi') \psi(\chi) = \lambda \psi(\chi'). \quad (7)$$

## Algorithm for optimal estimator calculation

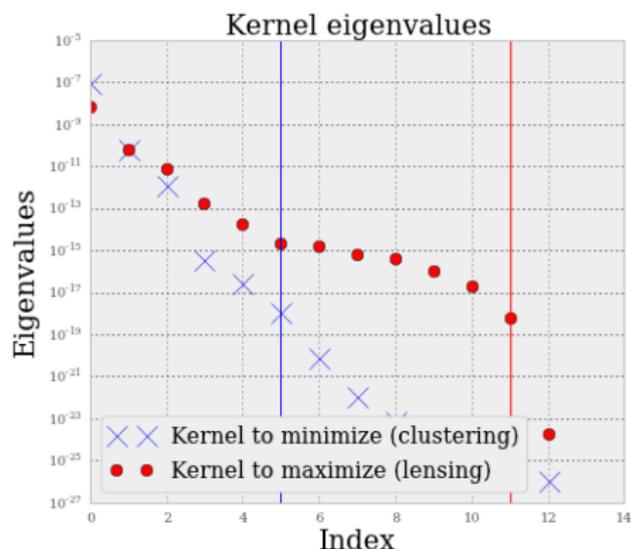
1. Solve for the eigenfunctions of the lensing and clustering symmetric source kernels ( $K$ ) and define which physical effect is to be maximized (e.g. lensing) and which is to be nulled (e.g. clustering).
2. Find components of the eigenfunctions of the source kernel to be maximized (e.g. lensing) that are in the null space of the source kernel to be nulled (e.g. clustering) using Gram-Schmidt orthogonalization. Construct a basis set from these components for the final weight functions.
3. Solve for a combination of basis functions that optimizes the signal-to-noise ratio to construct the pair weights for the cross-correlation function estimator.

## 2-bin example: $dN/dz$ models

Example: Cross-correlation of 2 tomographic bins with Gaussian photo-z errors

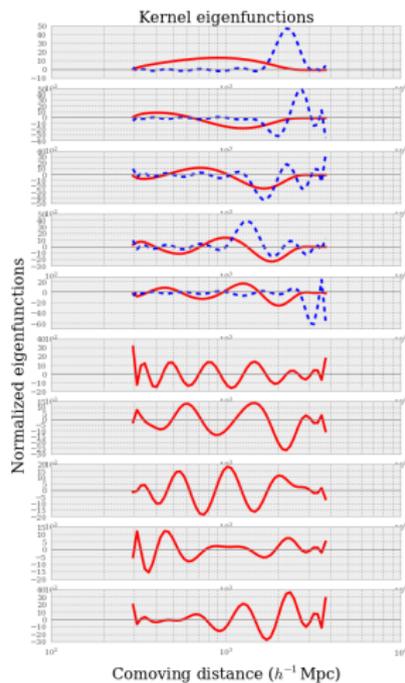


# Kernel eigenvalue spectrums

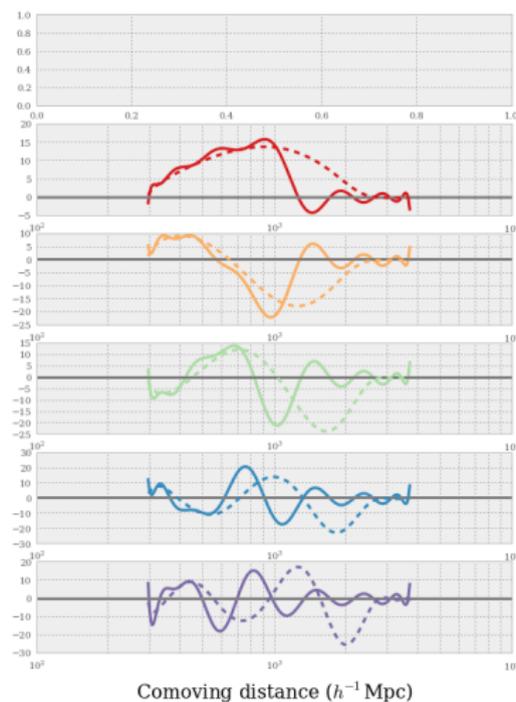


Only 4-5 eigenfunctions are useable due to numerical errors.

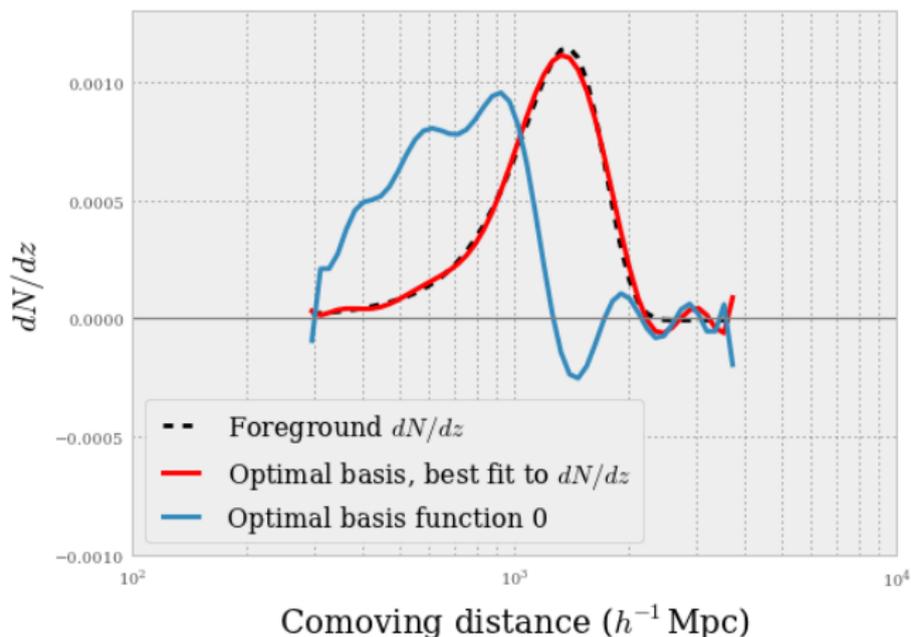
# Kernel eigenfunctions



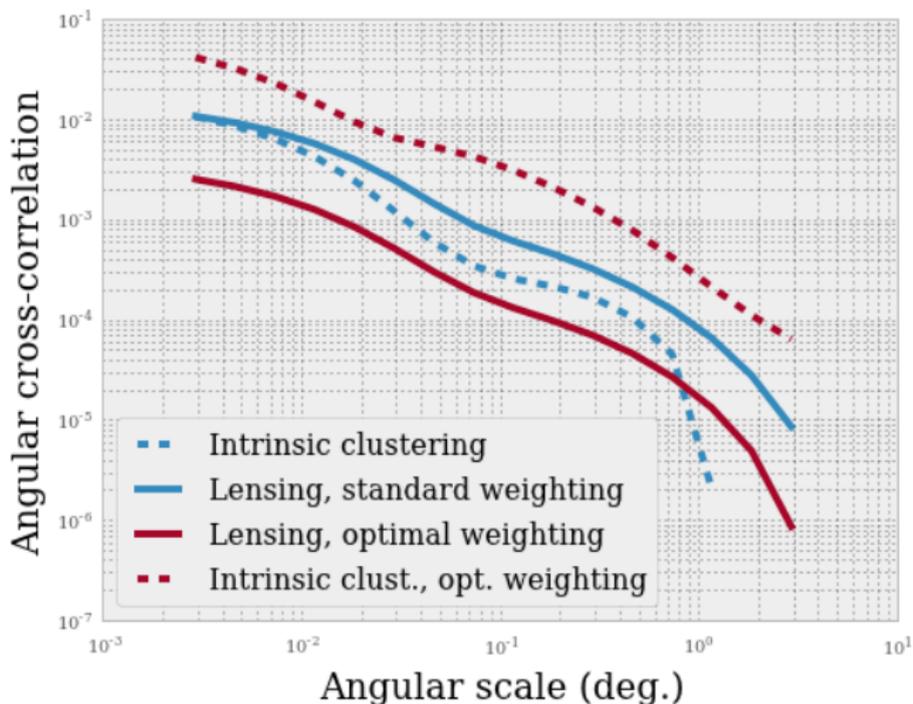
# Kernel eigenfunctions after nulling



# $dN/dz$ with optimal foreground weights



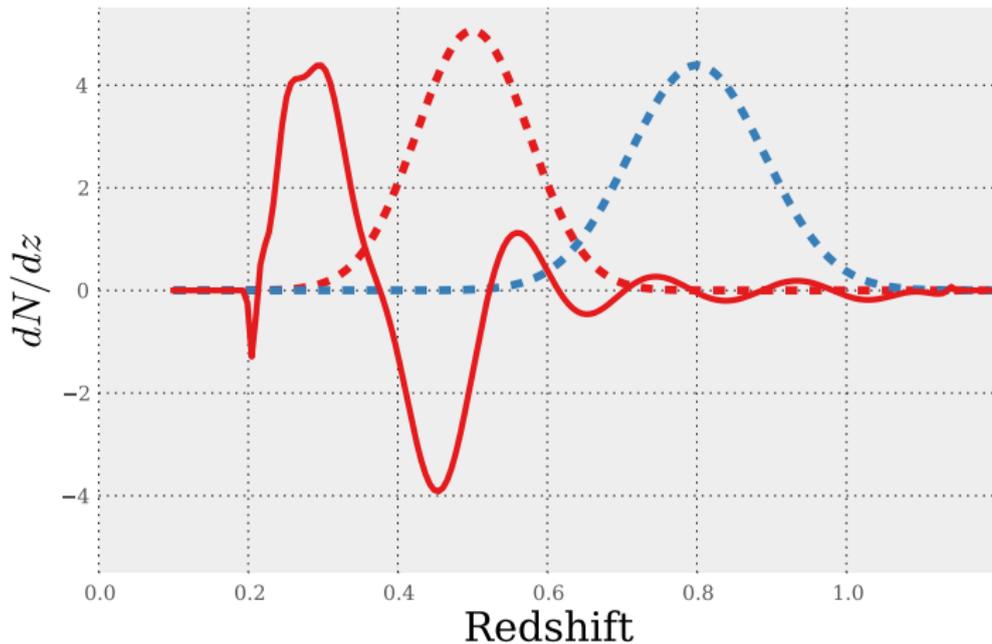
# Optimized clustering correlation



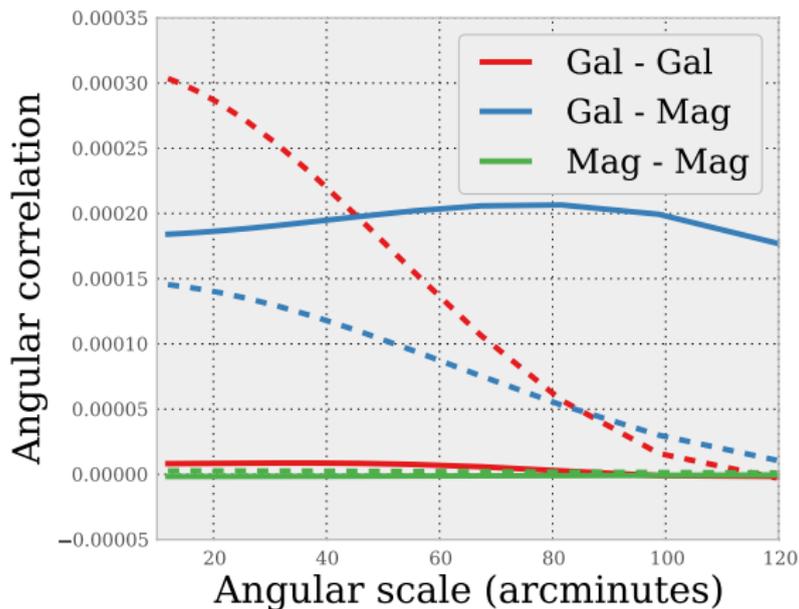
## LSST tomography: Fiducial model

- $w(a) = w_0 + (1 - a)w_a$
- 4 tomographic bins
- $0.5 < z < 1.4$  – chosen to cover region most sensitive to  $w_a$
- 3 photo- $z$  nuisance parameters:  $z_{\text{cen}}$ ,  $\sigma_z$ ,  $f_{\text{outlier}}$ 
  - $\sigma_z = 0.05(1 + z)$
  - $f_{\text{outlier}} = 0.05$  for all bins
- linear galaxy clustering bias (all analysis limited to linear scales)
  - Consider zero bias and 1% bias with respect to ‘true’ values
- Marginalize over  $\sigma_8$  and  $\Omega_m$

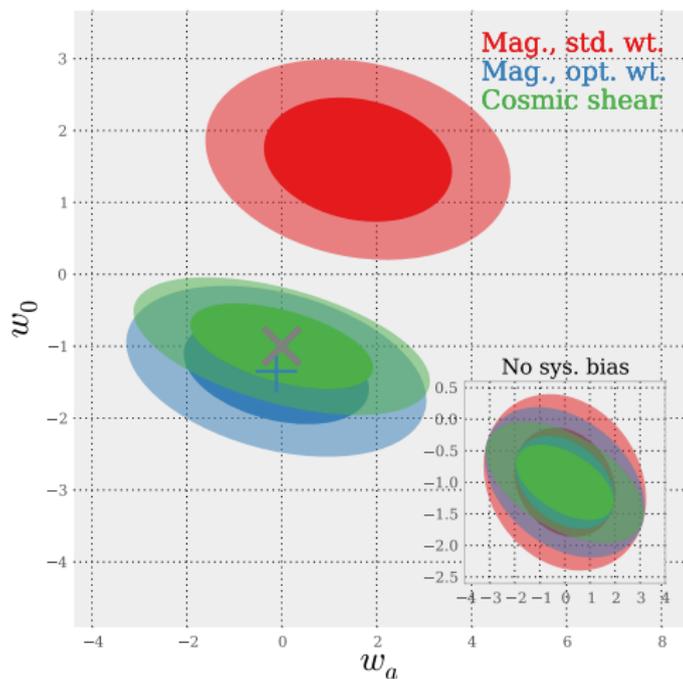
# Optimal $dN/dz$ for 1st foreground bin



## Cross-correlations between 1st 2 bins



# Forecasts on $w(z)$



## Summary and Conclusions

- General method to optimize the SNR and minimize theoretical systematics in angular correlations.
- With optimization, the **lensing magnification** measured via cross-correlations of photo-z bins may yield a dark energy **Figure of Merit up to 80% that from cosmic shear** with the same set of galaxies and tomographic binning.
- The combination of optimized lensing and clustering correlations helps **self-calibrate the linear galaxy bias**.
- Typically, at least  **$10^6$  sources are required in each foreground redshift bin** to detect lensing magnification via cross-correlations with optimal redshift weighting (because many galaxies are down-weighted, increasing shot noise).